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# Computational Study of Hippocampal-Septal Theta Rhythm Changes Due to Beta-Amyloid-Altered Ionic Channels

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## Abstract

Electroencephalography (EEG) of many dementia patients has been characterized by an increase in low frequency field potential oscillations. One of the characteristics of early stage Alzheimer's disease (AD) is an increase in theta band power (4–7 Hz). However, the mechanism(s) underlying the changes in theta oscillations are still unclear. To address this issue, we investigate the theta band power changes associated with  $\beta$ -Amyloid (A $\beta$ ) peptide (one of the main markers of AD) using a computational model, and by mediating the toxicity of hippocampal pyramidal neurons. We use an established biophysical hippocampal CA1-medial septum network model to evaluate four ionic channels in pyramidal neurons, which were demonstrated to be affected by A $\beta$ . They are the L-type  $\text{Ca}^{2+}$  channel, delayed rectifying  $\text{K}^{+}$  channel, A-type fast-inactivating  $\text{K}^{+}$  channel and large-conductance  $\text{Ca}^{2+}$ -activated  $\text{K}^{+}$  channel. Our simulation results demonstrate that only the A $\beta$  inhibited A-type fast-inactivating  $\text{K}^{+}$  channel can induce an increase in hippocampo-septal theta band power, while the other channels do not affect theta rhythm. We further deduce that this increased theta band power is due to enhanced synchrony of the pyramidal neurons. Our research may elucidate potential biomarkers and therapeutics for AD. Further investigation will be helpful for better understanding of AD-induced theta rhythm abnormalities and associated cognitive deficits.

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## Introduction

Alzheimer's disease (AD) is a neurodegenerative disease associated with memory deficits and cognitive decline, which may be induced by anatomical and physiological changes in the brain. AD is characterized by two neuropathological structures: neurofibrillary tangles and senile plaques. The neurofibrillary tangles are the residue of neuronal death, which may be caused by the microtubule-binding protein, tau, becoming hyperphosphorylated. The senile plaques are mainly composed of A $\beta$ . A $\beta$  acts as a neurotoxin causing neuronal dysfunction and apoptosis [1]. As A $\beta$  precedes tau protein in AD progress [2], we will focus on A $\beta$  in this work.

It has also been found that pathological changes in the brain can lead to abnormalities in oscillations of field potentials recorded by EEG [3,4,5] and local field potential (LFP) [6]. The AD induced brain field potentials oscillation abnormalities and the cause of these abnormalities are complex. Previous studies have shown that early stages of AD are characterized by an increase in theta band (4–7 Hz) power and decrease in beta band (13–30 Hz) and alpha band (8–12 Hz) power [3,7,8]. The abnormalities may be caused by the pathological changes in many brain regions, e.g., medial temporal lobe and cortex [9]. In this work, we will focus on the A $\beta$  affected hippocampal pyramidal neurons and the associated theta band power changes for various reasons, e.g., the hippocampus is affected at the early onset of AD [10], especially the pyramidal cells in the hippocampus [4] and the hippocampus and the

associated medial septum are one of the major sources of low frequency theta oscillation.

A $\beta$  (mainly A $\beta_{1-42}$ ) can oligomerize and permeate into the cell membrane, which can break down the regulation of  $\text{Ca}^{2+}$  movement and ionic homeostasis of neurons [11]. A $\beta$  may change the activity of various ionic channels, e.g., A $\beta$  has been found to be able to potentiate L-type  $\text{Ca}^{2+}$  channels [12,13]. A $\beta$  also affects  $\text{K}^{+}$  channels, which have an intimate relationship with the cell resting potential and membrane repolarization. It has been reported in [14] that low concentration of A $\beta$  blocks A-type fast-inactivating  $\text{K}^{+}$  channels and a high concentration of A $\beta$  can also block delayed rectifying  $\text{K}^{+}$  channels. The effect of A $\beta$  on large-conductance  $\text{Ca}^{2+}$ -activated  $\text{K}^{+}$  channels (BK) is still a subject of debate. BK channels were reported to be activated by A $\beta$  [15,16,17]. However, other research has shown that A $\beta$  suppresses BK channels in some cases [18,19,20]. Arispe et al. [21] proposed a hypothesis that A $\beta$  could also form new cation channels in neuronal membrane. In addition, A $\beta$  can disturb the neurotransmitter systems by inducing cholinergic and glutamatergic dysfunctions [22]. All of the pathological changes outlined above may result in alterations in theta band power. As a first step in our study, we focus on the changes in these four ionic channels, i.e., L-type  $\text{Ca}^{2+}$  channel ( $I_{\text{Ca}}$ ); A-type fast-inactivating  $\text{K}^{+}$  channel ( $I_{\text{A}}$ ), delayed rectifying  $\text{K}^{+}$  channel ( $I_{\text{K}}$ ) and large-conductance  $\text{Ca}^{2+}$ -activated  $\text{K}^{+}$  channel ( $I_{\text{CT}}$ ), and evaluate any corresponding change in hippocampal theta band power.

To investigate the effect of A $\beta$  on hippocampo-septal theta rhythm, we make use of a biophysical model of the hippocampal CA1 region and the medial septum. The spiking neuronal network model consists of hippocampal principle pyramidal neurons, basket and OLM interneurons and the medial septal MSGABA neurons. The model of pyramidal neurons is constructed based on [23,24]. The basket, OLM and MSGABA interneurons are modelled in the same way as presented in [25,26]. Synapses in our work are mediated by typical neurotransmitters GABA<sub>A</sub>, NMDA and AMPA, which are based on [27]. The aim is to evaluate the relationship between A $\beta$  induced changes in ionic channels ( $I_{Ca}$ ,  $I_K$ ,  $I_A$  and  $I_{CT}$ ) and the theta band power alterations. The effects of A $\beta$  on those channels are simulated by changing the amplitudes of these ionic currents. Our simulation results show that theta band power is highly dependent on  $I_A$  but not  $I_{Ca}$ ,  $I_K$  and  $I_{CT}$ . In particular, theta band power significantly increases with a decrease in  $I_A$ . We propose that this increased theta band power is induced by the enhanced synchrony of pyramidal neurons. This hypothesis is supported by our simulation results.

## Methods

We construct a network model of hippocampus CA1-medial septum based on the Hodgkin-Huxley type formalisms presented in [27]. The model incorporates three types of neurons from the hippocampus, i.e., excitatory pyramidal, inhibitory basket and OLM neurons and inhibitory MSGABA neurons from the medial septum. These neurons have been demonstrated to contribute to theta rhythm activity in *in vivo* experiments [28,29,30] and in simulation studies [26,31]. A schematic diagram of the neuronal network architecture is illustrated in Figure 1. Each type of neuron in Figure 1 represents a population of identical neurons.

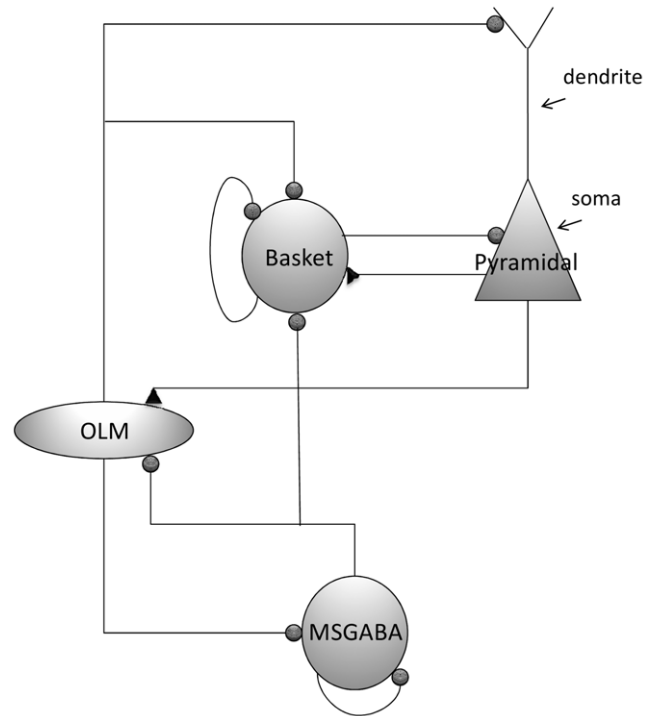
The pyramidal neurons are modelled by a two-compartmental model, one for the soma and the other for the dendrite. As in [23], the soma compartment has spike generating currents  $I_{Na}$  and  $I_K$  and the dendrite contains a calcium dependent potassium current  $I_{AHP}$ . Both the soma and dendrite contain leakage currents  $I_L$  and high-threshold L-type calcium currents  $I_{Ca}$  plus hyperpolarization-activated currents  $I_h$ . The pyramidal neurons in hippocampus CA1 contain additional ionic currents to account for different neuronal functions [24]. In this work, we select some of these currents, which have been shown to be affected by A $\beta$ . As a result, our model also contains an A-type potassium current  $I_A$  and a large-conductance calcium dependent potassium current  $I_{CT}$  in the soma and dendrite, respectively. The Hodgkin-Huxley type dynamical equations for the pyramidal neurons are:

$$\frac{dV_s}{dt} = -I_L - I_{Na} - I_K - I_{Ca} - I_A - I_{CT} - I_h - \frac{g_c}{p}(V_s - V_d) - I_{syn,s} + I \quad (1)$$

$$\frac{dV_d}{dt} = -I_L - I_{Ca} - I_{AHP} - I_A - I_{CT} - I_h - \frac{g_c}{1-p}(V_d - V_s) - I_{syn,d} \quad (2)$$

where subscript  $s$  and  $d$  denotes soma and dendrite, respectively.  $I$  is the injected DC current and  $I_{syn}$  is the synaptic currents from interneurons.

The other three inhibitory neurons are modelled as one-compartment. The model of basket neurons has  $I_{Na}$ ,  $I_K$ , and leakage current  $I_L$ , Eq. 3. The model of OLM has  $I_{Na}$ ,  $I_K$ ,  $I_L$ ,  $I_{Ca}$ , hyperpolarization activated current  $I_h$  and  $I_{AHP}$ , Eq. 4. MSGABA contains  $I_{Na}$ ,  $I_K$ ,  $I_L$  and a slowly inactivating potassium current



**Figure 1. Hippocampo-septal network architecture.** The network consists of four types of neuronal populations, i.e., pyramidal, basket, OLM and MSGABA neurons. Inhibitory GABA<sub>A</sub>-mediated synaptic connections are indicated by '●', and excitatory AMPA and NMDA-mediated synaptic connections are indicated by '▲'.  
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$I_{KS}$ , Eq. 5.

$$\text{Basket: } \frac{dV}{dt} = -I_L - I_{Na} - I_K - I_{syn} + I \quad (3)$$

$$\text{OLM: } \frac{dV}{dt} = -I_L - I_{Na} - I_K - I_{Ca} - I_h - I_{AHP} - I_{syn} + I \quad (4)$$

$$\text{MSGABA: } \frac{dV}{dt} = -I_L - I_{Na} - I_K - I_{KS} - I_{syn} + I \quad (5)$$

To emulate heterogeneity in the real brain tissues, the injected DC current  $I$  for each neuron is not chosen to be identical. This is done by allowing  $I$  to follow a Gaussian distribution with mean  $I_\mu$  and standard deviation  $I_\sigma$ .  $I_\mu$  for the pyramidal, basket, OLM and MSGABA neuronal populations are chosen to be  $5\mu A/cm^2$ ,  $1.4\mu A/cm^2$ ,  $0\mu A/cm^2$  and  $2.2\mu A/cm^2$ , respectively. As there is no agreement on the specific  $I_\sigma$  to be used, we chose  $I_\sigma = 0.1\mu A/cm^2$  for all populations for simplicity. This heterogeneity will be implemented in all our simulations. Definitions of all the other parameters are given in Appendix S1.

The number of pyramidal, basket, OLM and MSGABA neurons are 10, 100, 30 and 50, respectively [27]. In the network, the pyramidal neurons innervate basket neurons via neurotransmitter AMPA and OLM via AMPA+NMDA, other synaptic connections are mediated by GABA<sub>A</sub> neurotransmitter. We model their effects with rise and decay time constants of their synaptic

gating variables. It has been shown in [32] that the synaptic time constants have the equivalent effect of the conduction delays on the postsynaptic activities. Slight changes in these time contents do not affect our conclusion. The network is constructed using a sparse connectivity i.e., the neurons are randomly coupled with a fixed average number of pre-synaptic inputs/post-synaptic outputs per neuron. The number of pre-synaptic inputs/post-synaptic outputs is adjusted according to [27].

We compute the LFP signal as a sum of the values of the synaptic currents of the pyramidal neurons [33]. This is under the assumption that pyramidal neurons contribute more to the overall signal due to their approximate open field arrangement. The fast components of the LFP are reduced by low pass filtering (0–40 Hz). The power spectrum is obtained by a fast Fourier transform with a 2 s length Hanning window. The relative theta band power (% of the total power) is calculated. A membrane potential noise that follows a Gaussian distribution with zero mean and 1.5mV standard derivation is also introduced in some of the following simulations. The membrane noise is randomly generated in each trial that lasts for 10 s. Each presented result is obtained from simulations averaged over 15 trials of the model representing different individual patients. We found that higher number of trials does not alter the obtained average theta band power. The results from trials of the model run with normal parameter settings are considered as a “healthy” control group whereas trials with alterations to parameters of various ionic channels simulate deficiencies and are considered as potential different “patient” groups. Various ionic channels are potentiated or suppressed to simulate the effects of A $\beta$ , which will be presented in the next section. All of the results were obtained by adjusting the ionic currents in the pyramidal neurons only. The statistical significance of the differences between groups is evaluated using a one-way ANOVA test. Error bars are standard errors.

## Results

The dynamics of neurons in theta oscillation obtained in control condition are demonstrated in Figure 2. To better illustrate the spiking phases of different neuronal populations, membrane noise is removed. Figure 2 shows that theta oscillation is generated by the spiking of different neuronal populations clustered at certain phases. Assuming a network theta oscillation begins with spikes from the pyramidal neurons. Then the OLM neurons are evoked via the excitatory synaptic connections from the pyramidal neurons, which produce a feedback inhibition to the pyramidal neurons. The basket neurons then gradually depolarize and produce series of spikes. The spikes of basket neurons are inhibited by the spiking of MSGABA neurons. The slowly inactivating potassium current  $I_{KS}$  in MSGABA neuron plays a very important role in the theta generation, which is referred to as a ‘pacemaker’ for theta rhythm [26].

It has been pointed out that the main cause of the loss of intracellular calcium homeostasis in AD patients is that A $\beta$  can potentiate the L-type  $Ca^{2+}$  channels ( $I_{Ca}$ ) [13], which causes a large influx of  $Ca^{2+}$  into the cells. The mechanism of A $\beta$  increasing the influx of  $Ca^{2+}$  is still unclear. A $\beta$  may form new cation channels and/or alter the existing L-type  $Ca^{2+}$  channels. In our simulations, we emulate the effect of A $\beta$  by increasing the maximum conductance of the L-type  $Ca^{2+}$  channels. The obtained theta band power with enhanced  $I_{Ca}$  is presented in Figure 3. It can be seen that changes in L-type  $Ca^{2+}$  channels do not cause a change in theta rhythm.

A $\beta$  also blocks some  $K^+$  ionic channels in pyramidal neurons, e.g.,  $I_A$  and  $I_K$  [14,34]. The experimental results showed that A $\beta$  is

more likely to block the channel from outside the neurons. Therefore we emulate the effect of A $\beta$  by decreasing the maximum conductance of  $I_A$  and  $I_K$ , respectively. Furthermore, it has been shown that  $I_A$  has larger density in dendrite compared with soma [35] and A $\beta$  have much greater effect on the dendrite  $I_A$  [36,37]. Based on these findings, only  $I_A$  in the dendrite will be reduced. The simulation results obtained in control and decreased  $I_A$  in the dendrite only conditions are illustrated in Figure 4. Our simulation shows that theta band power is significantly increased ( $p < 0.05$ ) as  $I_A$  decreases. An example of the auto-correlation of the summation of all membrane potentials and the corresponding band power in control and 0.6 $g_A$  conditions is illustrated in Figure 5 and 6. It can be seen that theta oscillation and its power is significantly increased with low  $g_A$ . Similar changes in theta band power due to  $I_K$  (via  $g_K$ ) are not observed, as illustrated in Figure 7.

As AD disturbs the homeostasis of  $Ca^{2+}$ , the  $Ca^{2+}$ -activated BK channel ( $I_{CT}$ ) is vulnerable to AD pathology. BK channel can adjust the spike broadening during repetitive firing [38] and spiking frequency [39]. Previous research reveals that the activity of BK channel is probably promoted by A $\beta$  [17]. However, other research reports that BK channel is suppressed in some cases [18,19,20]. Therefore, we have simulated both increased and blocked  $I_{CT}$  in our simulations.  $I_{CT}$  is potentiated by increasing the fraction of  $Ca^{2+}$  influx,  $B$  (see Appendix S1). The simulation results are illustrated in Figure 8. It can be seen that neither blockage nor potentiation in  $I_{CT}$  can affect theta rhythm.

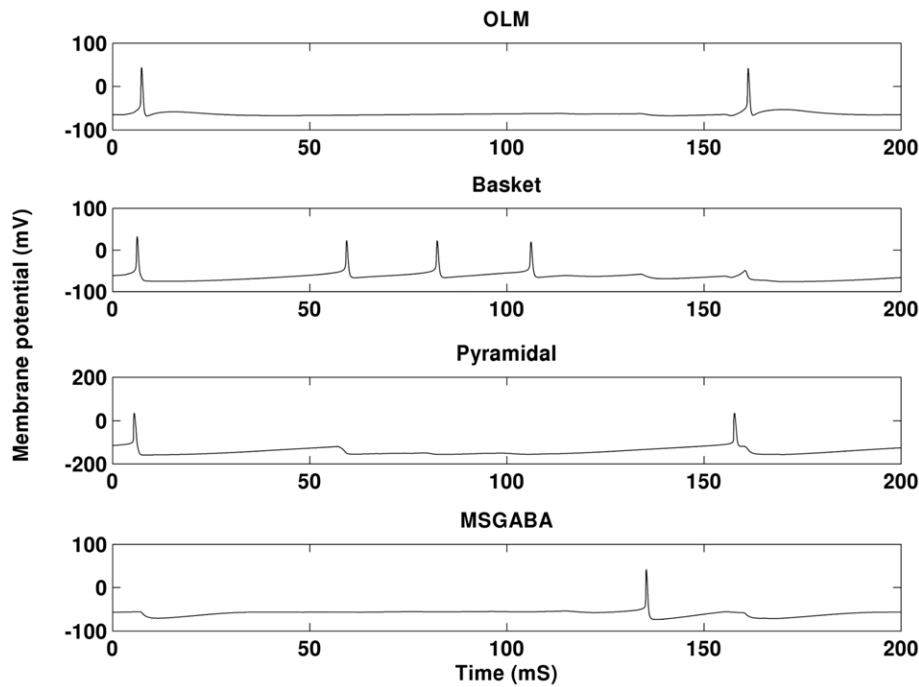
The simulation results have shown that a decrease in  $I_A$  can significantly increase theta band power. To evaluate whether this is due to an enhanced synchrony of neuronal populations, we calculate the population coherence coefficient [40]. In this section,  $g_A$  is decreased in both soma and dendrite simultaneously. The long time interval  $T$  ( $T = 2s$  in our experiment) is first divided into small bins of  $\tau = 1ms$  and spike trains of the  $i^{th}$  and  $j^{th}$  neurons in the population are given  $X_i(l), X_j(l) = 1$  or  $0$ ,  $l = 1, \dots, K$  ( $K = T/\tau$ ), where ‘1’ denotes spiking and ‘0’ resting. The coherence coefficient  $\kappa_{ij}$  between the trains can be calculated as

$$\kappa_{ij} = \frac{\sum_{l=1}^K X_i(l)X_j(l)}{\sqrt{\sum_{l=1}^K X_i(l) \sum_{l=1}^K X_j(l)}} \quad (6)$$

The whole population  $\kappa$  is obtained by averaging all of the combinations of  $i$  and  $j$ .  $\kappa$  is calculated for the control group and the group with decreased  $g_A$ . In the following simulations,  $I_A$  in both soma and dendrite are decreased simultaneously. The obtained  $\kappa$  is illustrated in Figure 9. Consistent with our hypothesis, population synchrony is significantly increased as  $g_A$  decreases ( $p < 0.001$ ).

The increased synchrony is probably caused by the enhanced excitability and firing rate of the pyramidal neurons. To support this hypothesis, the firing rates of the pyramidal neuronal population with various values of  $g_A$  are shown in Figure 10. It can be clearly seen that the decreased  $g_A$  has enhanced the excitability of the pyramidal neurons and their firing rates. Therefore, we suggest that when  $I_A$  is decreased, the pyramidal neurons become more excitable. During the peak of each pyramidal population theta cycle, more pyramidal neurons spike simultaneously, which enhances the synchrony of the population.

In summary, our simulations have shown that a decrease in  $I_A$  in the pyramidal neurons induces an increase in theta band power by recruiting more pyramidal neurons to fire.

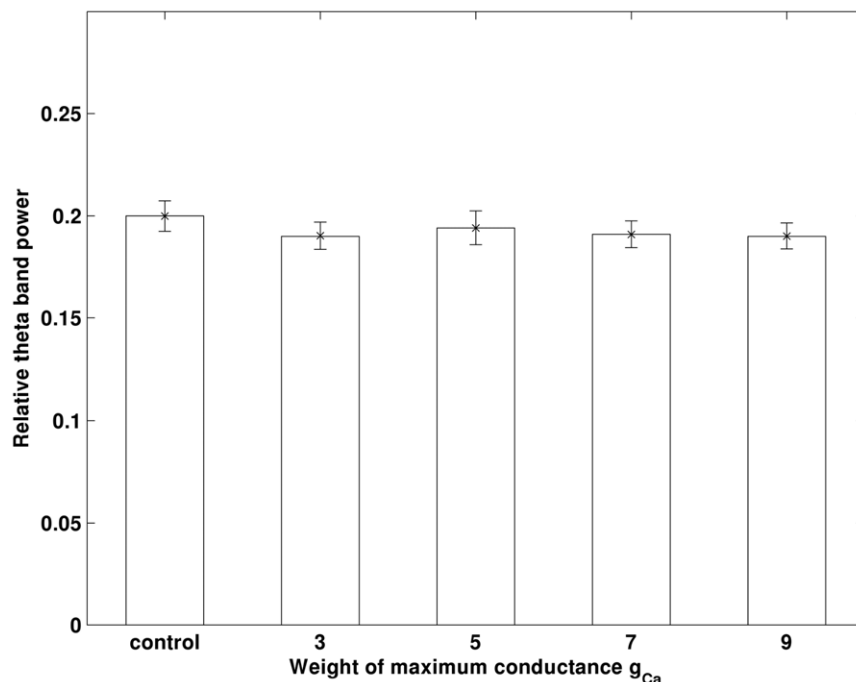


**Figure 2. Membrane potential dynamics in theta oscillation.** Each individual network theta oscillation period consists of spikes of different neuronal populations clustering around different phases. The figures are obtained in control condition without membrane noise.  
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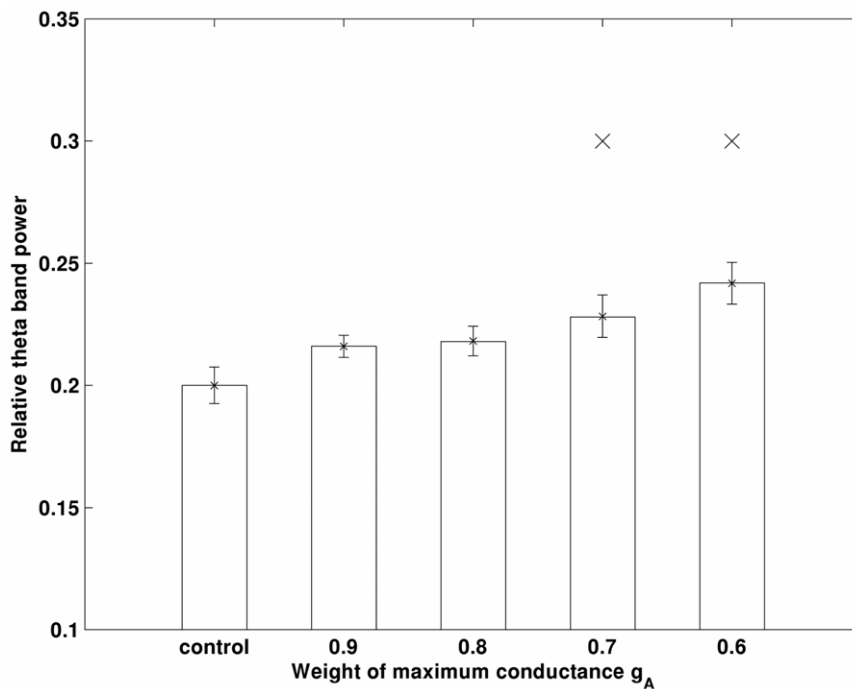
## Discussion

AD is usually accompanied with alterations in neuronal network oscillations. The patterns of oscillation changes in different frequency bands have been used to discriminate the AD-induced dementia from the other dementias [41]. The aim of our work is to

better understand the mechanisms underlying these oscillation abnormalities. We have investigated rhythms using other types of models and looked at connectivity changes in our previous work, e.g., we have investigated the AD-induced alpha rhythm abnormalities [42] and the relationship between changes in alpha and theta rhythms [43] using an abstract model. In this work, we



**Figure 3. Increase in  $g_{Ca}$  does not induce changes in theta band power.** In the figure, the obtained average theta band power of each experiment is illustrated. Errorbar is standard error.  
doi:10.1371/journal.pone.0021579.g003

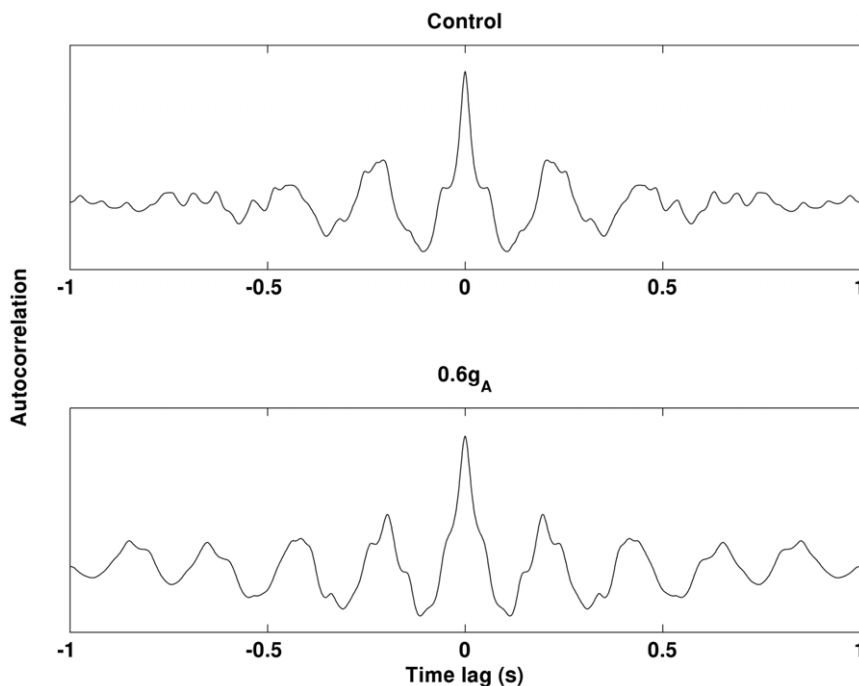


**Figure 4. Theta band power increases with decrease in  $g_A$ .** × indicates that power is significantly larger than that obtained in control condition ( $p < 0.05$ ). Errorbar is standard error.  
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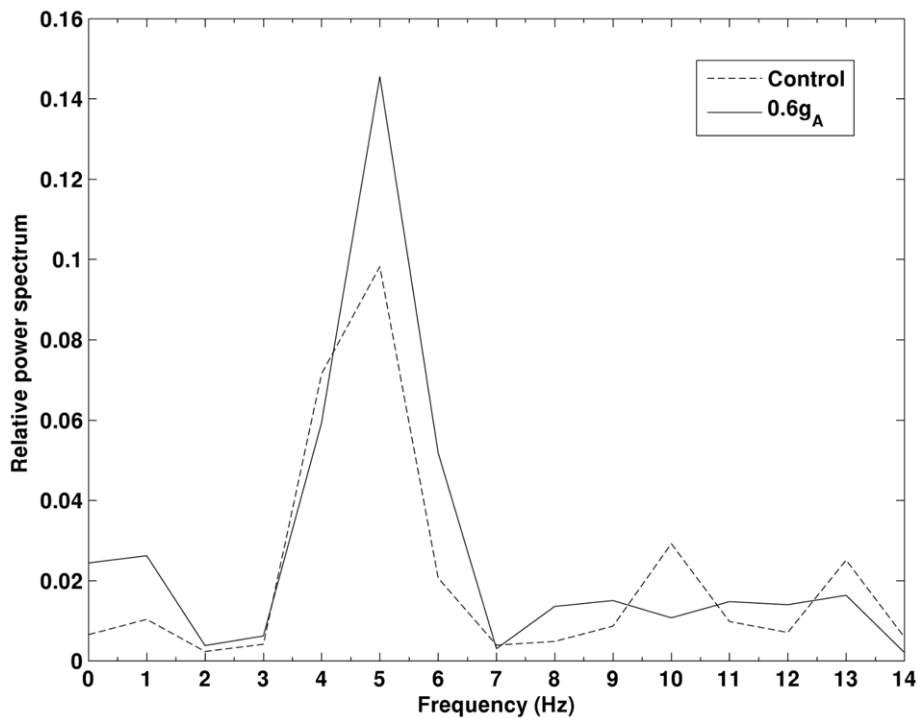
investigated the A $\beta$ -induced theta oscillation abnormality based on a conductance-based hippocampo-septal model.

Previous experimental results have demonstrated that A $\beta$  can induce neuronal dysfunction by altering certain ionic channels. The computational simulations have shown that some of the ionic

channels play critical roles in the neuronal network oscillations, e.g., [26]. However, the mechanisms underlying A $\beta$  induced hippocampo-septal theta rhythm alteration remains unclear. In this work, the change in theta band power caused by A $\beta$  has been investigated using a conductance-based hippocampus CA1 and



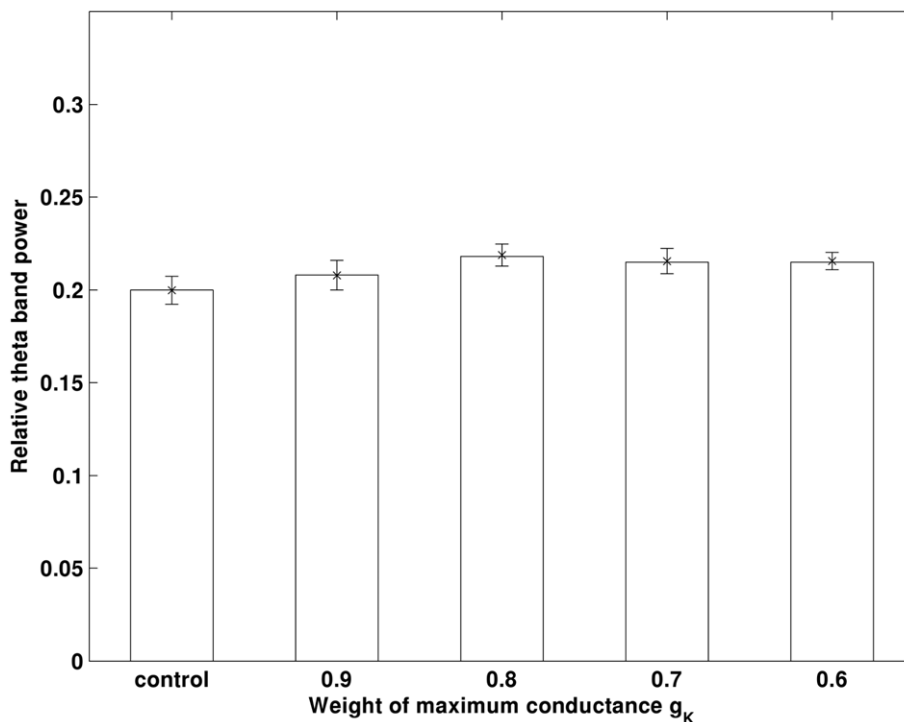
**Figure 5. The auto-correlations of a summation of membrane potentials obtained in control and  $0.6g_A$  conditions.** Theta rhythm is strengthened by decreased  $g_A$ . Both of the results are obtained in the same noisy and heterogenous condition obtained in single trial.  
doi:10.1371/journal.pone.0021579.g005



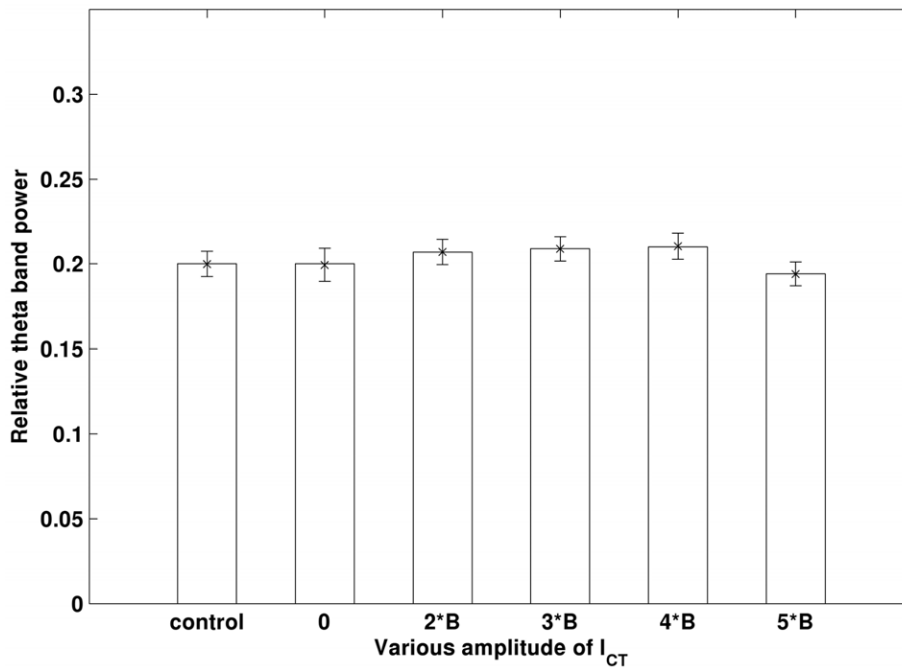
**Figure 6. More significant power spectrum peak in theta band in 0.6g<sub>A</sub> condition than in control condition.** Both of the results are obtained in the same noisy and heterogenous condition obtained in single trial.  
doi:10.1371/journal.pone.0021579.g006

medial septum network model. Based on previous experimental results, the effect of A $\beta$  was emulated by blocking or potentiating specific ionic channels. Then the corresponding theta band power

was calculated and compared with that obtained in a control (normal) condition. We have evaluated four types of ionic channels, one Ca<sup>2+</sup> and three K<sup>+</sup> channels. We have identified



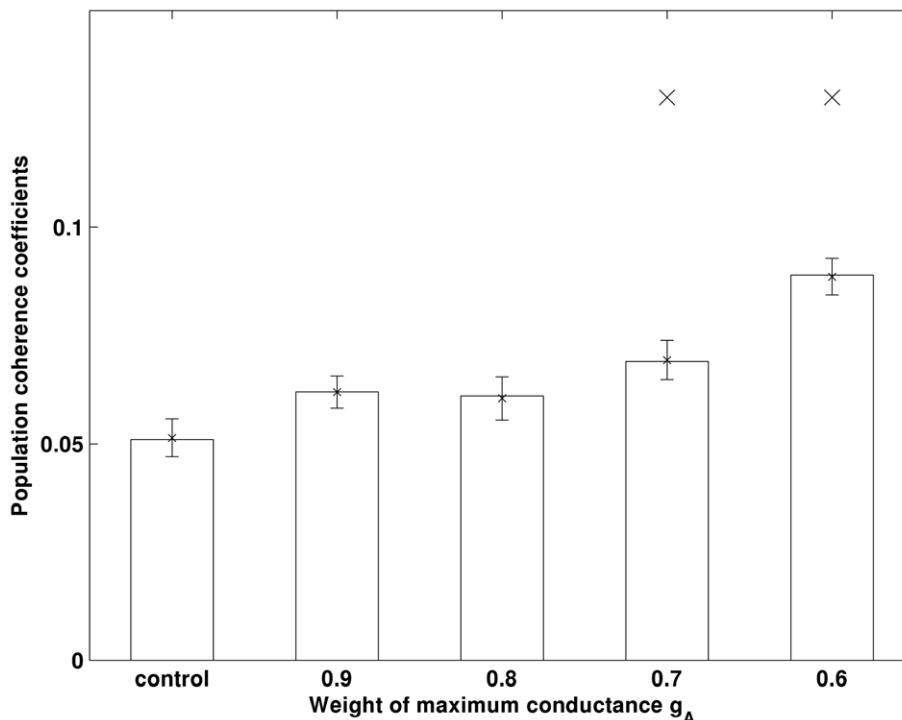
**Figure 7. Decrease in  $g_K$  does not induce significant changes in theta band power.** Errorbar is standard error.  
doi:10.1371/journal.pone.0021579.g007



**Figure 8. Change in  $I_{CT}$  does not induce significant changes in theta band power.** Both the completely blocked  $I_{CT}$  (0) and the potentiated  $I_{CT}$  (2B, 3B, 4B, 5B) are evaluated. Errorbar is standard error.  
doi:10.1371/journal.pone.0021579.g008

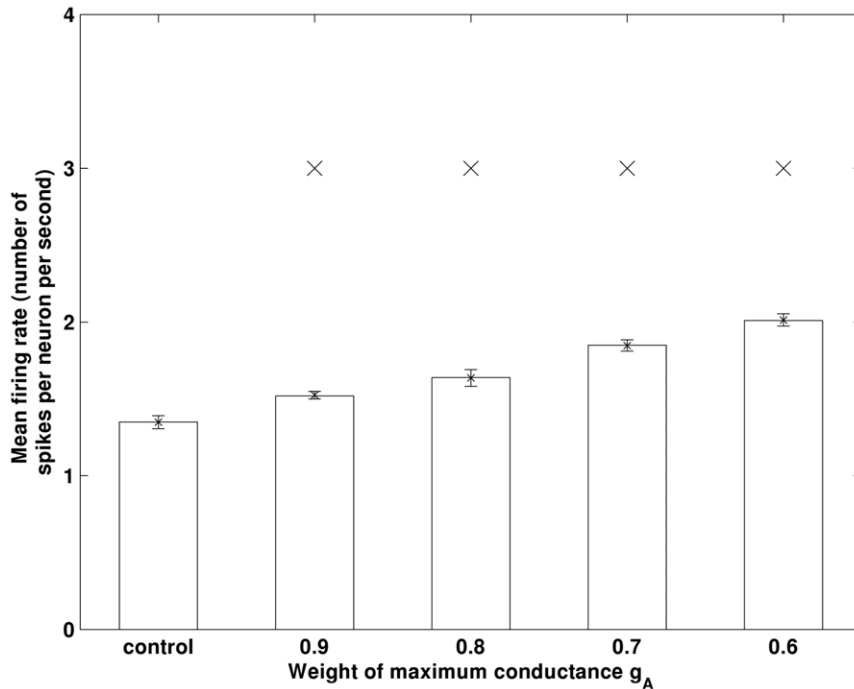
that only a decrease in fast-inactivating  $K^+$  currents ( $I_A$ ) affected theta band power. To explain its mechanism, we have proposed that the blockage of  $I_A$  by  $A\beta$  increases the excitability of pyramidal neurons, which led to more synchrony of pyramidal

neuronal firings. The synchronized firing state then propagated to other neuronal populations. As a result, theta band power was increased. Our hypothesis has been supported by various simulations. Our computational work has shown that  $A\beta$ -induced



**Figure 9. The pyramidal neuronal population coherence coefficients increase with  $g_A$  decreases.** 'x' indicates the coherence coefficient is significantly larger than that obtained in control condition ( $p < 0.01$ ). Errorbar is standard error.  
doi:10.1371/journal.pone.0021579.g009

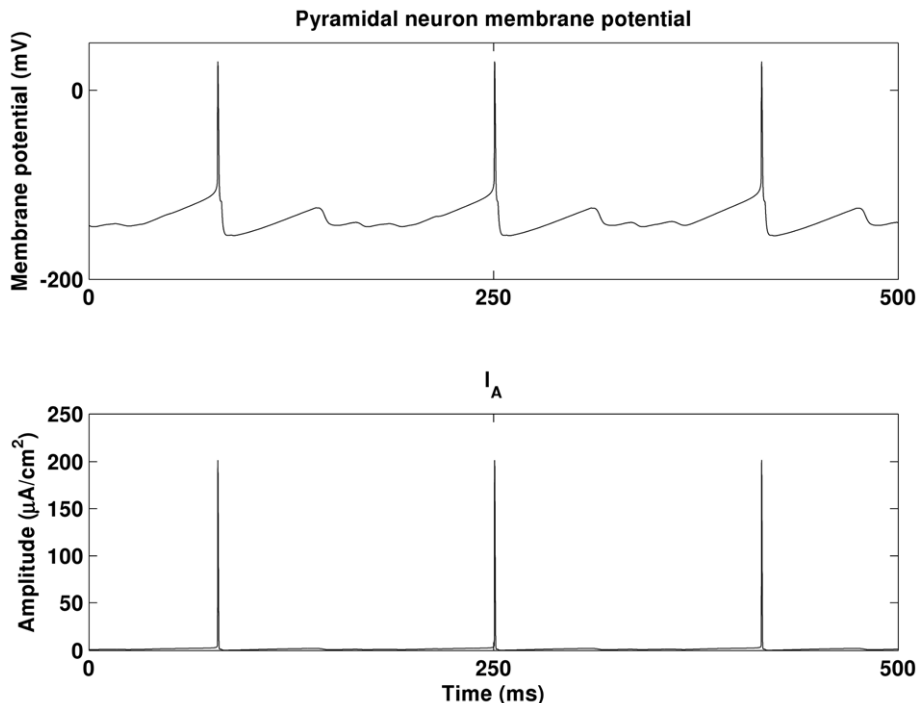




**Figure 10. The pyramidal neuronal population firing rates increase with decrease in  $g_A$ .** 'x' indicates the firing rate is significantly larger than that obtained in control condition ( $p < 0.001$ ). Errorbar is standard error.  
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$I_A$  depression could be an important factor in causing theta rhythm abnormalities in AD. Our results may have implications for the development of the AD biomarkers and therapeutics. For example, drugs which can potentiate  $I_A$  may be used to counteract the affect of  $A\beta$ . In fact, cannabinoids which can potentiate  $I_A$  [44], have been successfully used in AD treatment [45].

In this work, we have observed that decreased  $I_A$  can enhance the excitability of the pyramidal neurons and result in higher theta band power. However, how alterations in  $I_A$  change the excitability of pyramidal neurons is still unclear. If the activation of  $I_A$  is long lasting, then the mechanism may be straightforward, as reducing a long lasting current may allow more neurons to spike



**Figure 11. An example of dynamics of a pyramidal neurons and the associated brief transient  $I_A$ .**  
doi:10.1371/journal.pone.0021579.g011

per theta cycle. Figure 11 illustrates an example of dynamics of a pyramidal neuron and associated  $I_A$ . As shown,  $I_A$  actually operates very briefly as compared to theta rhythm. It resets shortly after a spike. Therefore, the mechanism underlying  $I_A$ -induced firing rate changes is a topic which deserves further attention and is the focus of our on-going research. Furthermore, we recognize that not all experimental observations fit with this picture of enhanced theta band power. For example, in [46], theta band power was found to decrease in rats' hippocampus injected with A $\beta$ . The mechanism underlying A $\beta$  induced theta band power decrease is also currently being investigated.

The long term potentiation and depression of synapses in the hippocampus play critical roles in the formation and processing of memories. Previous research [27] has shown that synaptic changes can also induce alterations in theta band power. To achieve this, the afference from other parts of brain, e.g., acetylcholine neuromodulation from medial septum, may be incorporated into the model. Furthermore, it has been found that AD is usually associated with an increase chance of unprovoked epilepsy [47]. In

a recent study [48], it has been shown that A $\beta$  could be the main cause of epilepsy in AD due to hippocampal network hyperexcitability. Our work could provide a potential explanation for this observation. We will address these issues in our future work.

## Supporting Information

### Appendix S1 Definition of the model parameters. (DOC)

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## Author Contributions

Conceived and designed the experiments: XZ DC KW LM. Performed the experiments: XZ DC KW. Analyzed the data: XZ DC KW. Contributed reagents/materials/analysis tools: XZ DC KW. Wrote the paper: XZ DC KW LM.

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